

Split Rank of Triangle and Quadrilateral Inequalities

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Joint work with Santanu Dey (CORE)

Outline

- Cuts from two rows of the simplex tableau
- The different cases to consider
- Split cuts and split ranks
- Finiteness proofs for the triangles
- The ideas for the quadrilaterals
- Conclusion

Cuts from two rows of the simplex tableau

Consider a mixed-integer program

$$\begin{aligned} \min \quad & c^T x \\ \text{s.t.} \quad & Ax = b \\ & x \in \mathbb{Z}_+^{n_1} \times \mathbb{R}_+^{n_2}. \end{aligned}$$

We consider the problem of finding **valid inequalities** cutting off the **linear relaxation optimum**.

We consider the simplex tableau

$$\begin{array}{rcl} x_1 & -\bar{a}_{11}s_1 - \cdots - \bar{a}_{1n}s_n & = \bar{b}_1 \\ & \vdots & \\ x_m - \bar{a}_{m1}s_1 - \cdots - \bar{a}_{mn}s_n & = \bar{b}_m. \end{array}$$

- Select **two rows**
- Relax the **integrality** requirements of the **non-basic variables**
- Relax the **nonnegativity** requirements of the **basic variables** but keeping **integrality**

Cuts from two rows of the simplex tableau

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The 2 row-model

The model

$$\begin{pmatrix} x_1 \\ x_2 \end{pmatrix} = \begin{pmatrix} f_1 \\ f_2 \end{pmatrix} + \sum_{j=1}^n \begin{pmatrix} r_1^j \\ r_2^j \end{pmatrix} s_j, \quad x_1, x_2 \in \mathbb{Z}, s_j \in \mathbb{R}_+$$

Model studied in [Andersen, Louveaux, Weismantel, Wolsey, IPCO2007] (for the finite case) and [Cornuéjols, Margot, 2009] (for the infinite case).

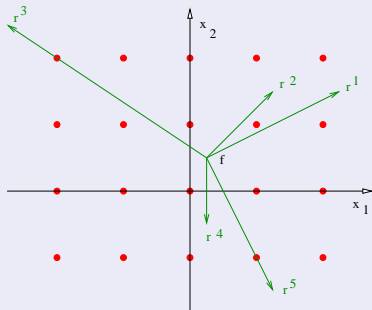
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The geometry

$$\begin{pmatrix} x_1 \\ x_2 \end{pmatrix} = \begin{pmatrix} 1/4 \\ 1/2 \end{pmatrix} + \begin{pmatrix} 2 \\ 1 \end{pmatrix} s_1 + \begin{pmatrix} 1 \\ 1 \end{pmatrix} s_2 + \begin{pmatrix} -3 \\ 2 \end{pmatrix} s_3 + \begin{pmatrix} 0 \\ -1 \end{pmatrix} s_4 + \begin{pmatrix} 1 \\ -2 \end{pmatrix} s_5$$

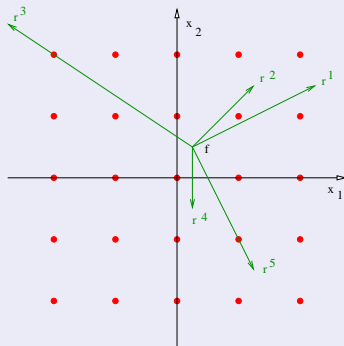


The geometry

The projection picture

$$2s_1 + 2s_2 + 4s_3 + s_4 + \frac{12}{7}s_5 \geq 1$$

- We project the $n + 2$ -dim space onto the x -space
- The facet is represented by a polygon L_α
- There is no integer point in the interior of L_α
- The coefficients are a ratio of distances on the figure



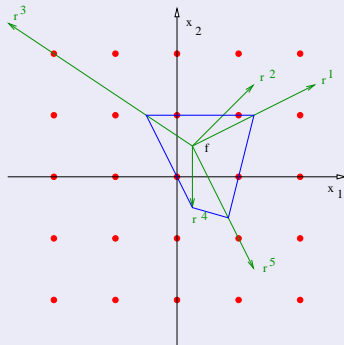
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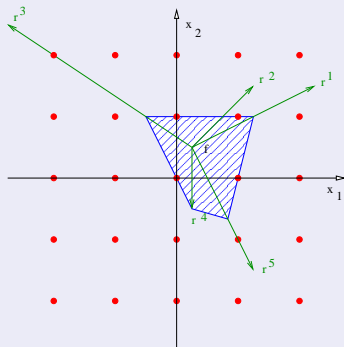
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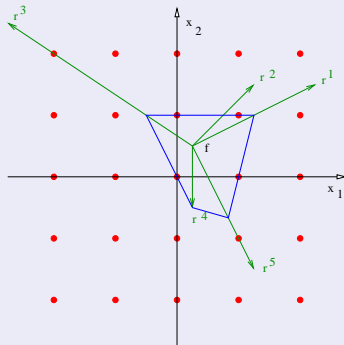
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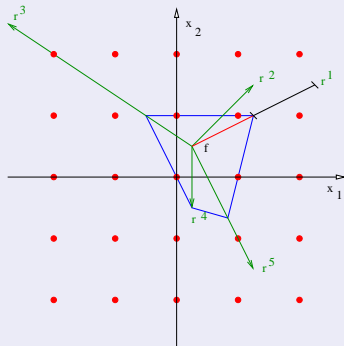
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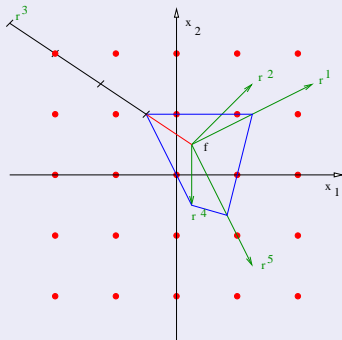
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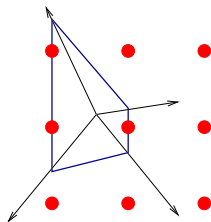
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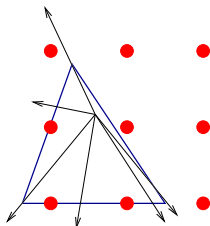


Classification of all possible facet-defining inequalities

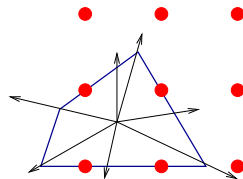
Theorem : All facets are projected to **triangles** and **quadrilaterals** [Andersen et al 2007].



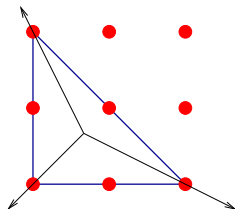
Split Cut



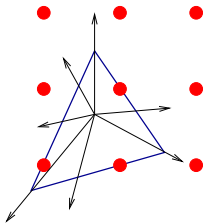
Triangle Cut



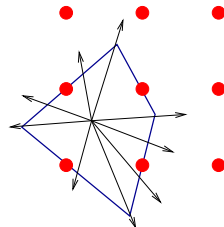
Quadrilateral Cut



Cook-Kannan-Schrijver



Dissection Triangle



Dissection Quadrilateral

The split rank question

- Split cut : applying a **disjunction** $\pi^T x \leq \pi_0 \vee \pi^T x \geq \pi_0 + 1$ to a polyhedron P

$$x = f + RS$$

$$s_1 \geq 0$$

$$\vdots$$

$$s_n \geq 0$$

$$\pi^T x \leq \pi_0$$

- The **first split closure** P^1 of P is what you obtain after having applied **all possible split disjunctions** π .
- The **split rank** of a valid inequality is the minimum i such that the inequality is **valid for P^i**
- Most inequalities used in commercial softwares are **split cuts**
- Question : what is the **split rank** of the **2 row-inequalities** ?
In how many rounds of **split cuts only** can we generate the inequalities ?
- The Cook-Kannan-Schrijver has infinite rank and we prove that the other triangles have finite rank.

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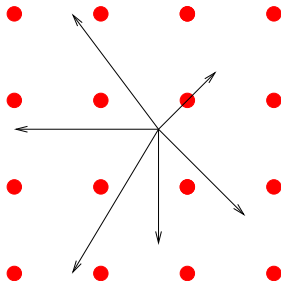
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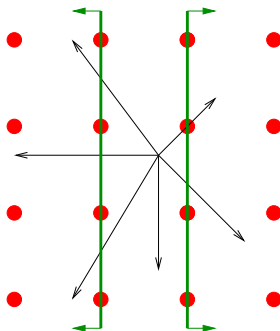
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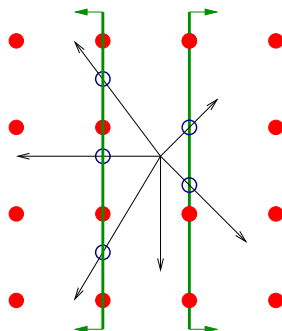
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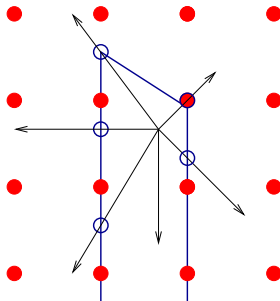
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Useful properties of the split rank

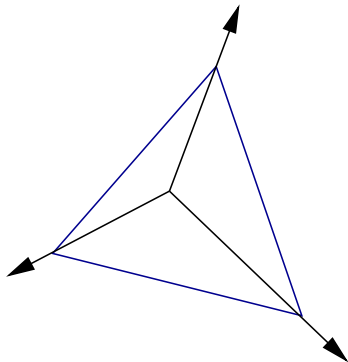
- The split rank is invariant up to **integer translation** and **unimodular transformation**
- (**Lifting**) Consider a triangle (or quadrilateral) inequality for a **3-variable problem**. If we **keep the same shape of the polygon** and consider an n -variable problem, the split rank **does not increase**.

It allows us to work with **3 variables only** when trying to find the split rank of triangles.

- (**Projection**) Let $\sum_{i=1}^n \alpha_i s_i \geq 1$ be an inequality with split rank η . Then the **projected inequality** $\sum_{i=1}^{n-1} \alpha_i s_i \geq 1$ has a split rank of at most η for the **projected problem**.

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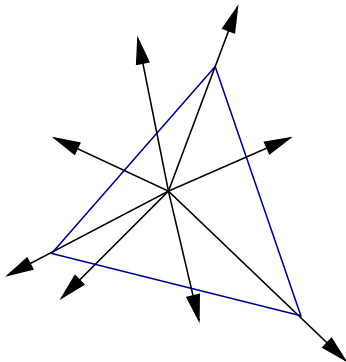


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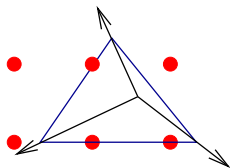
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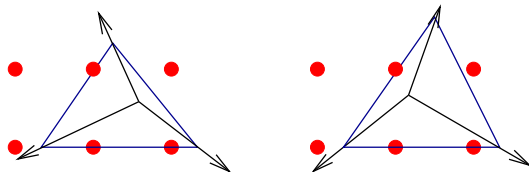
Several cases to consider, after suitable unimodular transformation



An illustration of the proof in this talk

The triangle case

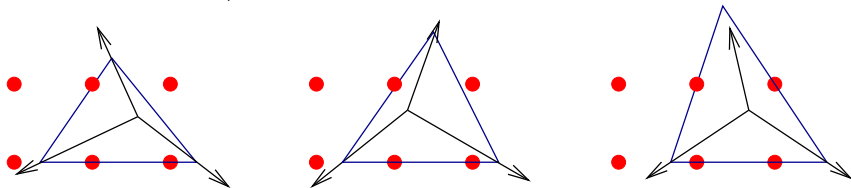
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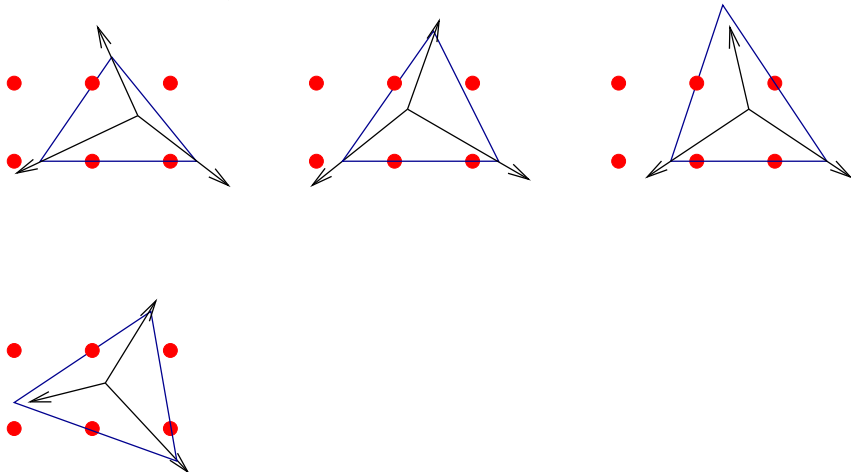
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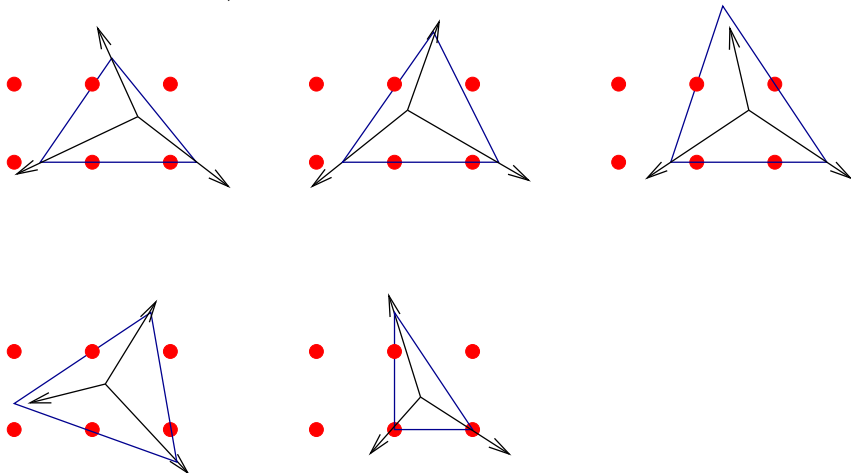
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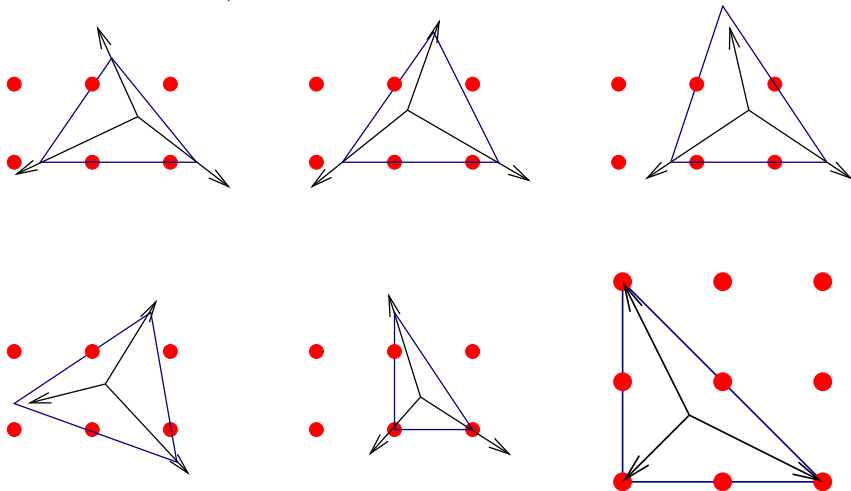
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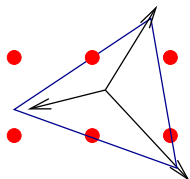
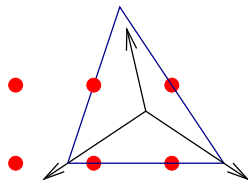
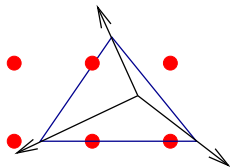
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Idea of the proof of upper bounds

- We prove an **upper bound** on the split rank.
- **Procedure** : We apply a **sequence of two split disjunctions**.
Successively : $x_1 \leq 0 \vee x_1 \geq 1$ and $x_2 \leq 0 \vee x_2 \geq 1$
- At step i , we **keep one inequality** of rank at most i and proceed to the next disjunction.
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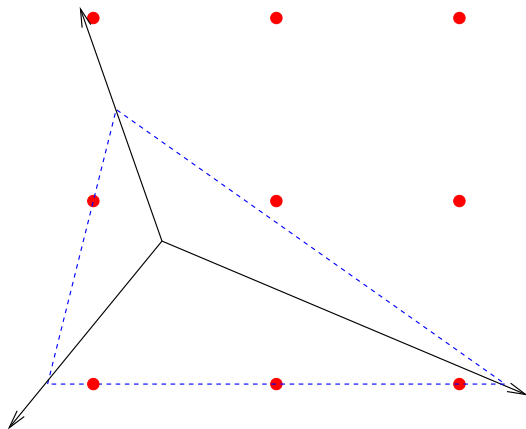
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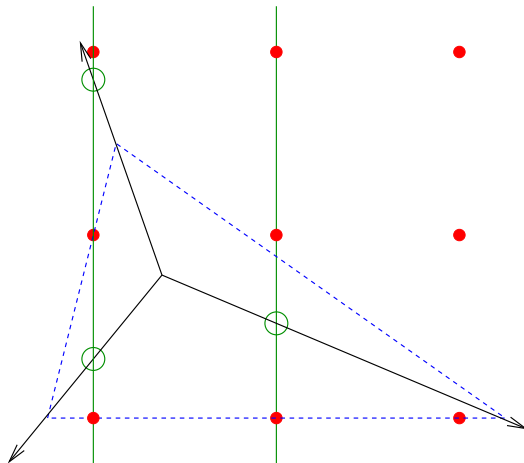
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One proof for a non-degenerate non-maximal triangle



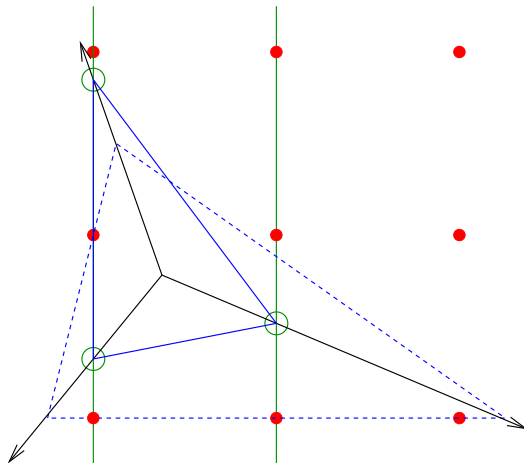
Rank 0

One proof for a non-degenerate non-maximal triangle



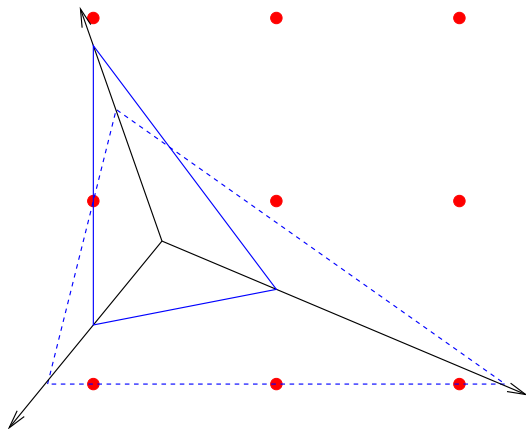
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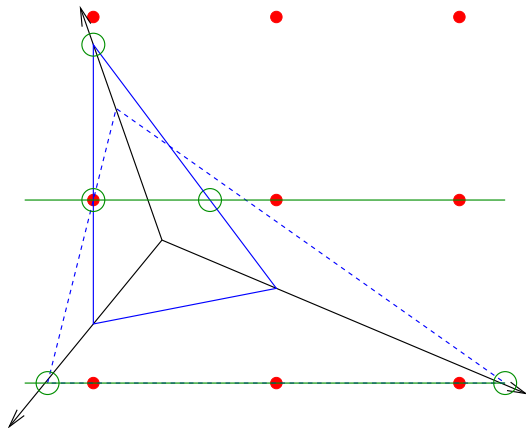
Rank 1

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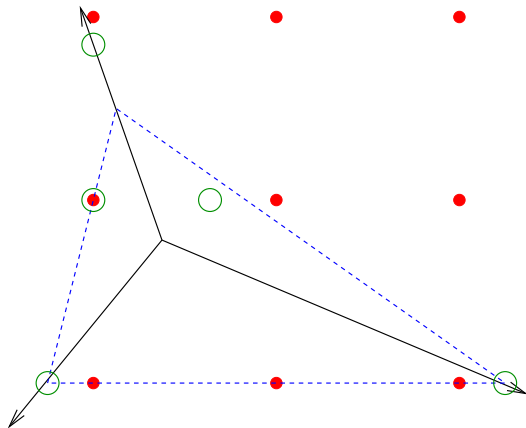
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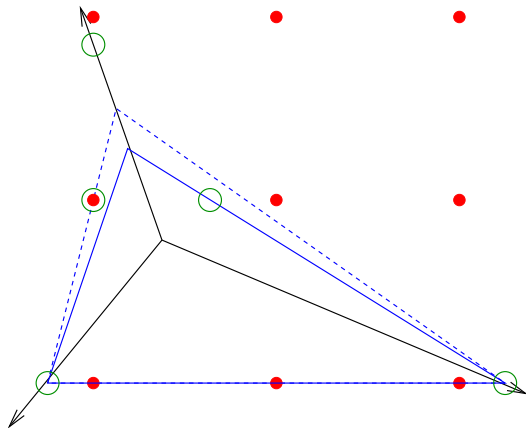


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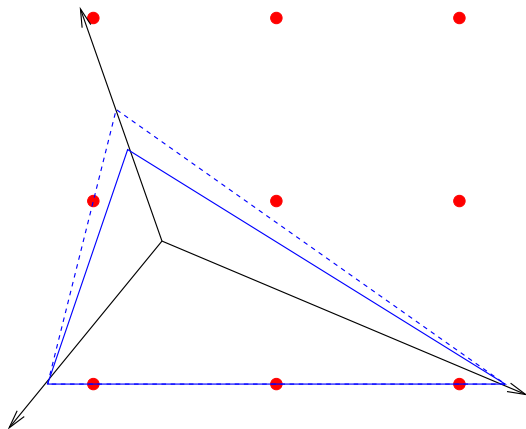


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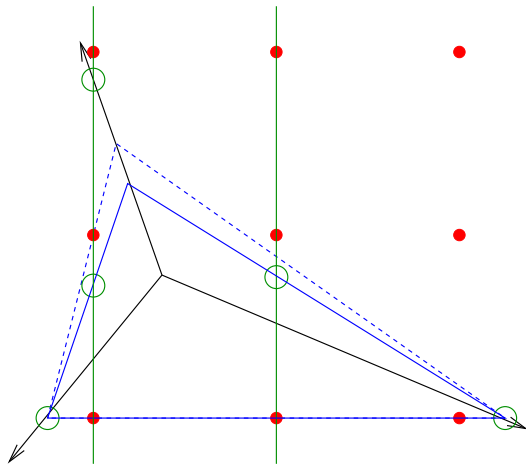
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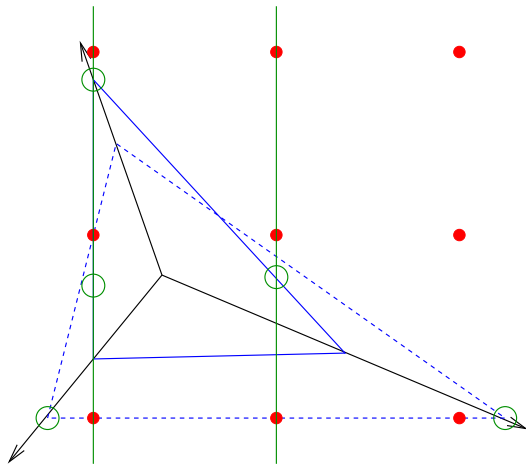
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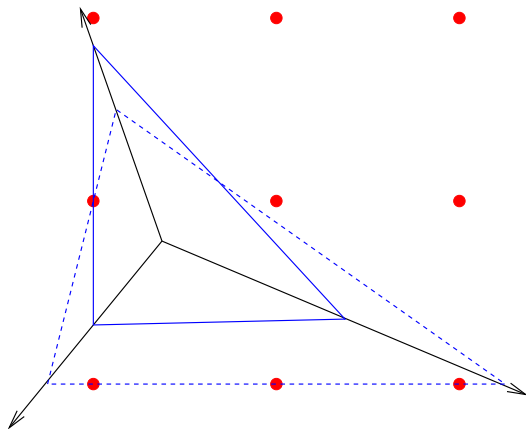
Rank 2

One proof for a non-degenerate non-maximal triangle



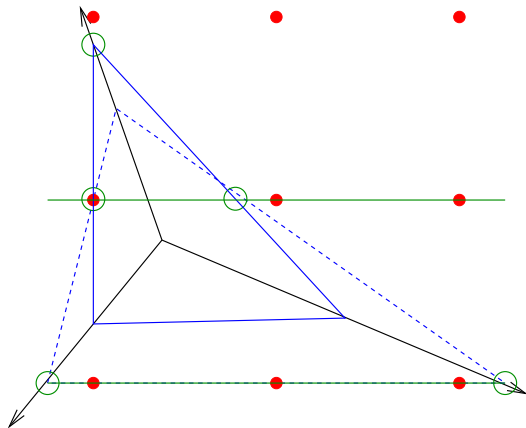
Rank 3

One proof for a non-degenerate non-maximal triangle



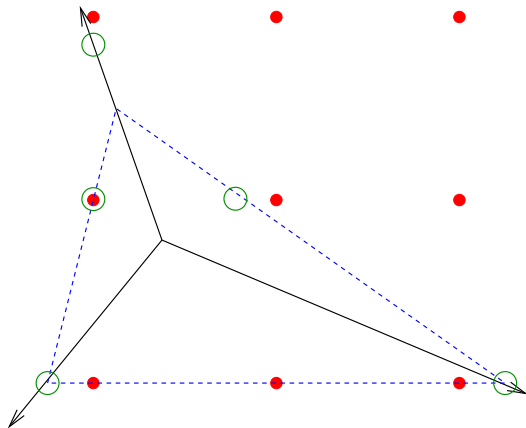
Rank 3

One proof for a non-degenerate non-maximal triangle

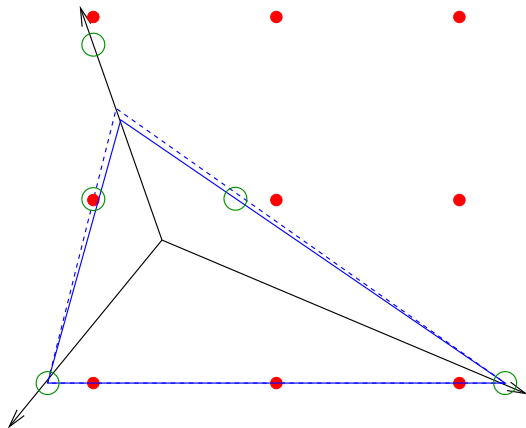


Rank 3

One proof for a non-degenerate non-maximal triangle

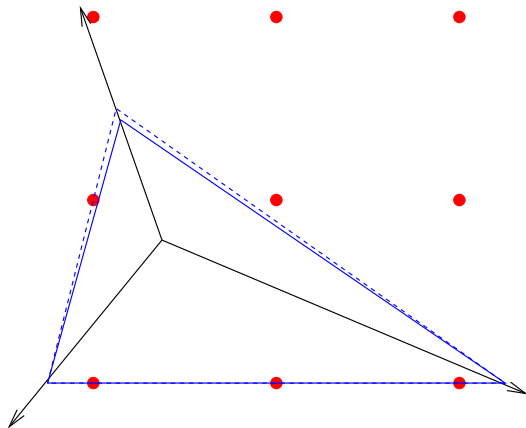


One proof for a non-degenerate non-maximal triangle



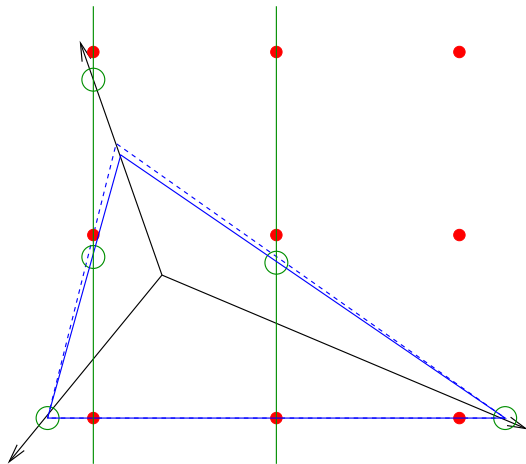
Rank 4

One proof for a non-degenerate non-maximal triangle



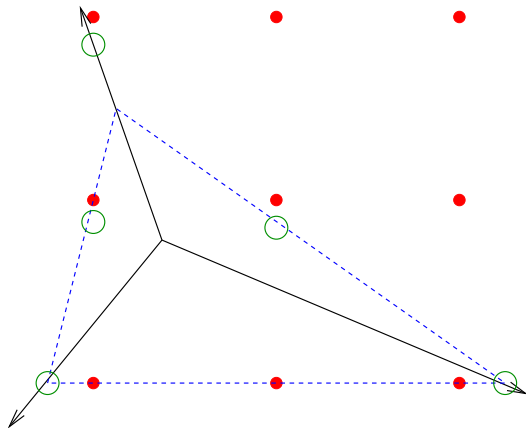
Rank 4

One proof for a non-degenerate non-maximal triangle

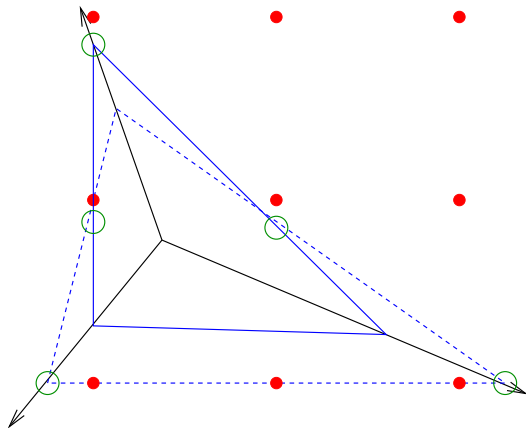


Rank 4

One proof for a non-degenerate non-maximal triangle

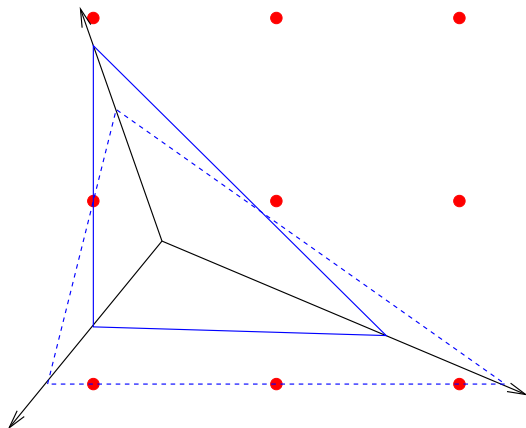


One proof for a non-degenerate non-maximal triangle



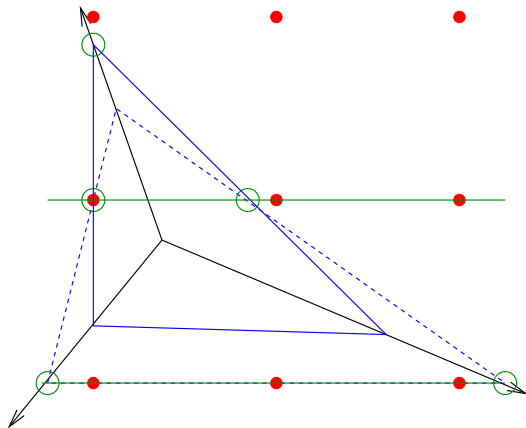
Rank 5

One proof for a non-degenerate non-maximal triangle



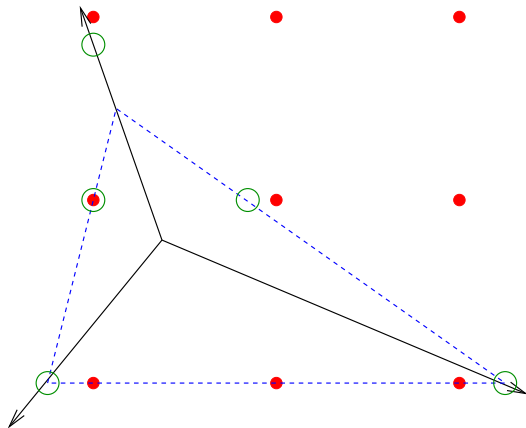
Rank 5

One proof for a non-degenerate non-maximal triangle

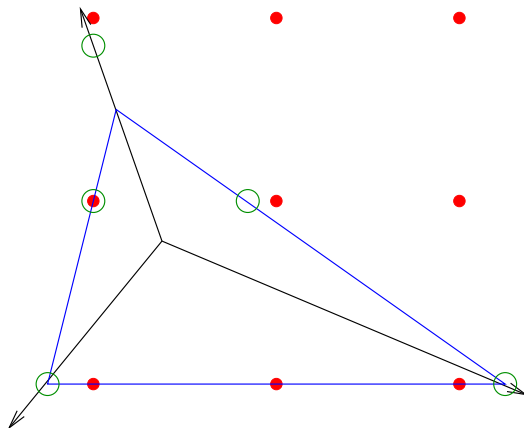


Rank 5

One proof for a non-degenerate non-maximal triangle

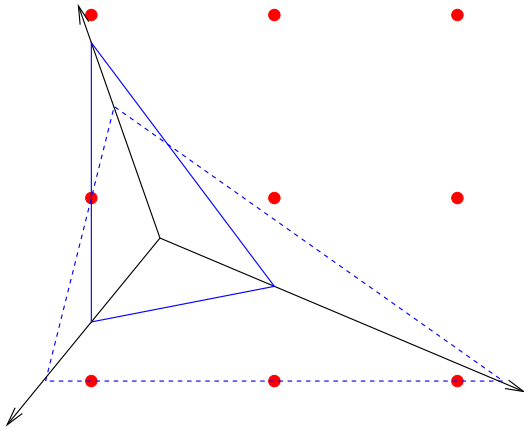


One proof for a non-degenerate non-maximal triangle

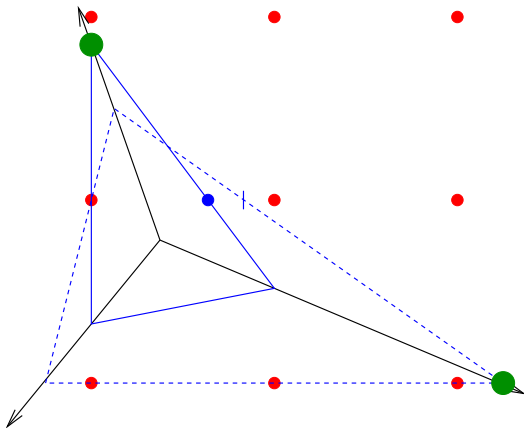


The goal inequality has a rank of **at most 6**

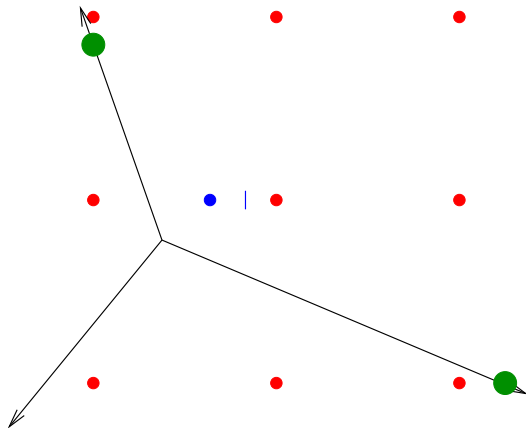
The geometry behind the convergence



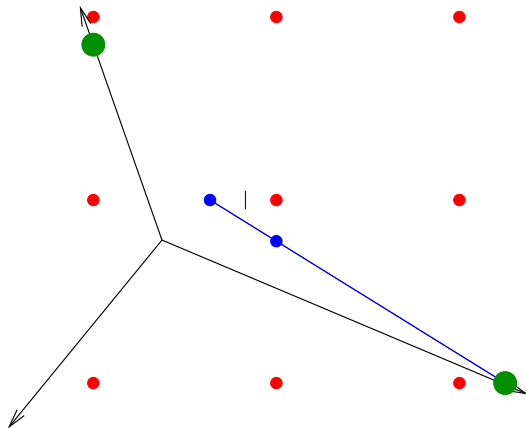
The geometry behind the convergence



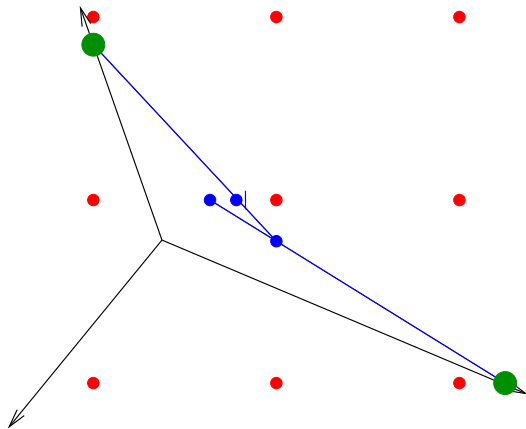
The geometry behind the convergence



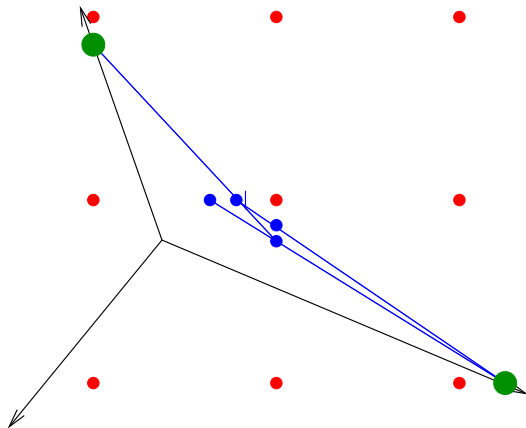
The geometry behind the convergence



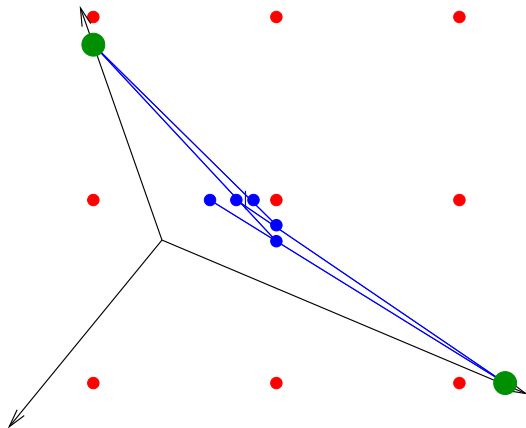
The geometry behind the convergence



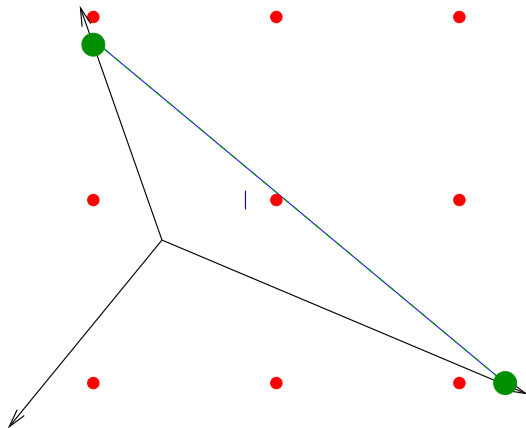
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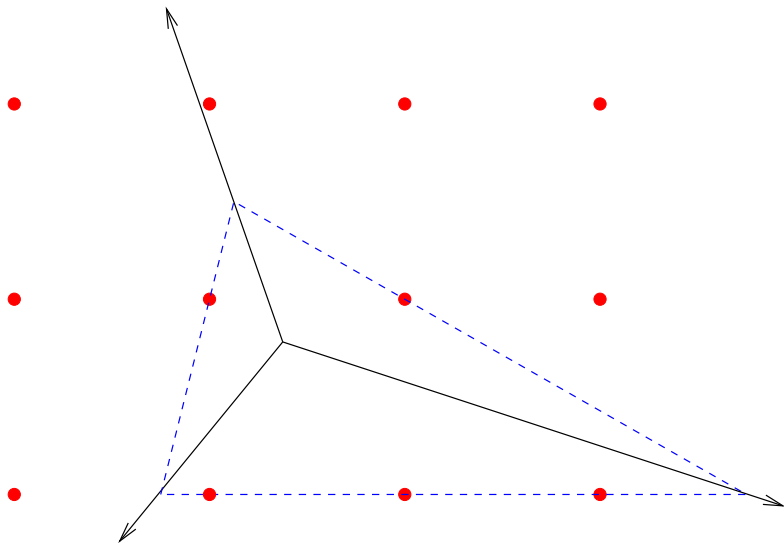
The geometry behind the convergence



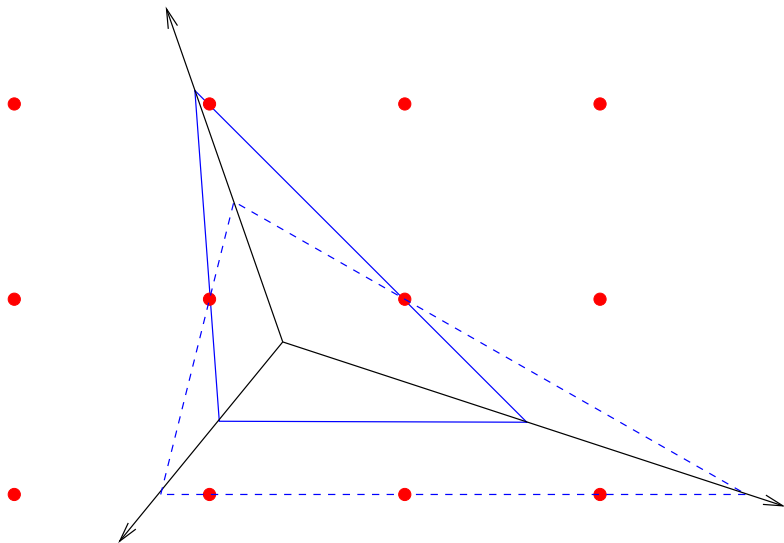
Assumptions for the following

- We have “proven” that a non-maximal triangle where the **upward ray points to the left** has a finite rank.
- We can prove that the constructed bound is **logarithmic in the number of bits of the input**.
- The proof for the **upward ray pointing to the right** works similarly (but not identically).
- In the following, we assume that **any non-maximal triangle has a finite rank**.

The maximal triangles

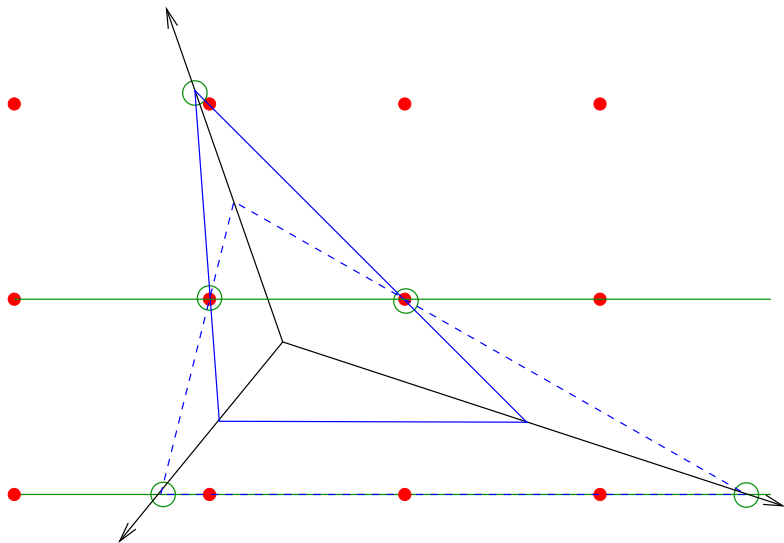


The maximal triangles

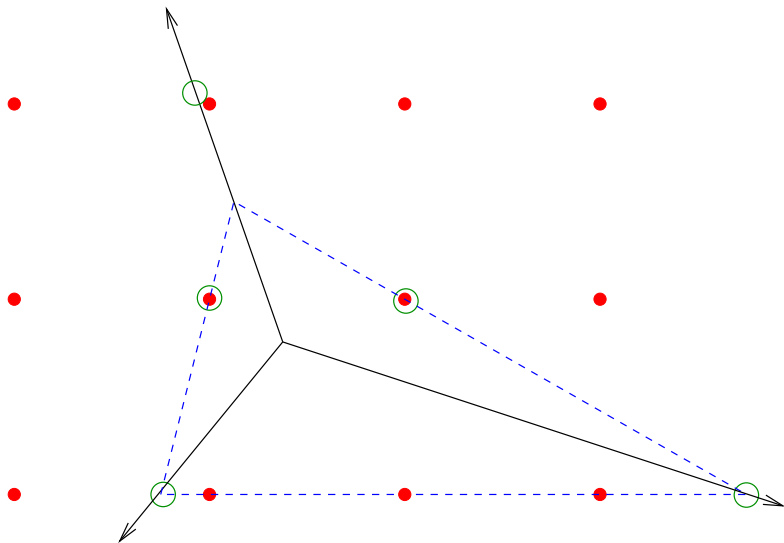


This inequality is a **non-maximal triangle** \Rightarrow **finite rank** !

The maximal triangles

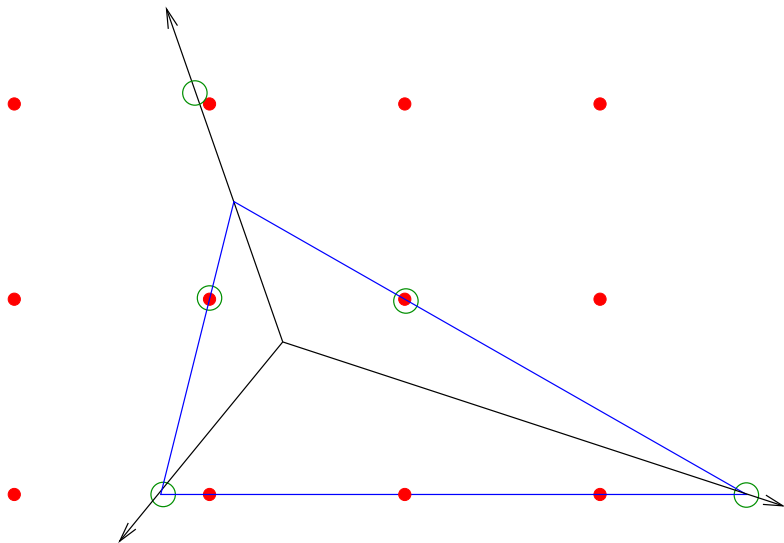


The maximal triangles



The goal inequality is valid for the disjunction.

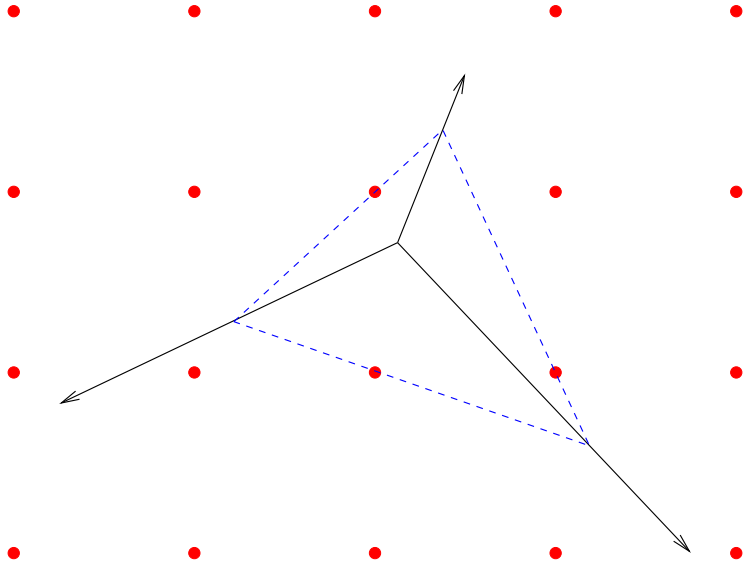
The maximal triangles



The goal inequality has a finite rank

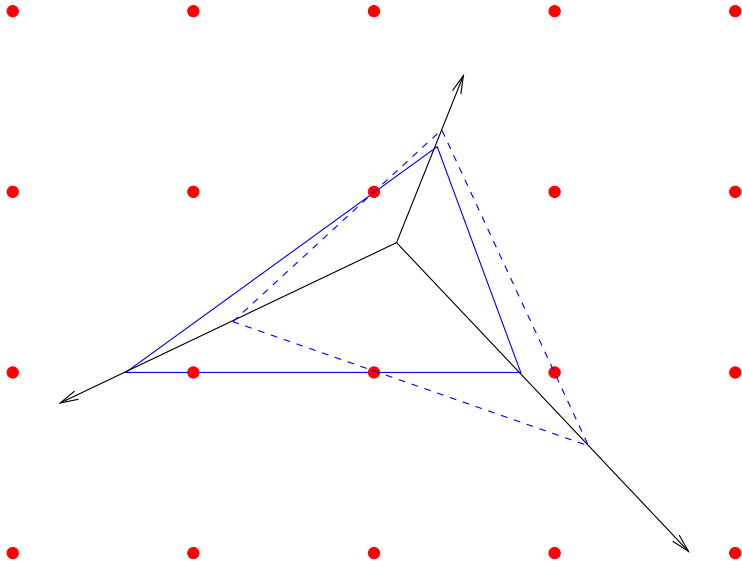
The dissection triangle

Dissection \equiv each side is tight at exactly one integer point



The dissection triangle

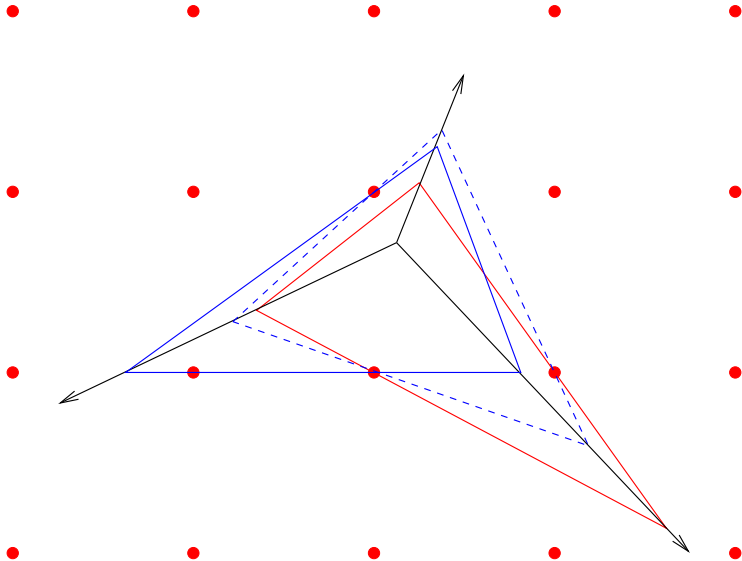
Dissection \equiv each side is tight at exactly one integer point



This inequality is a non-maximal triangle \Rightarrow finite rank !

The dissection triangle

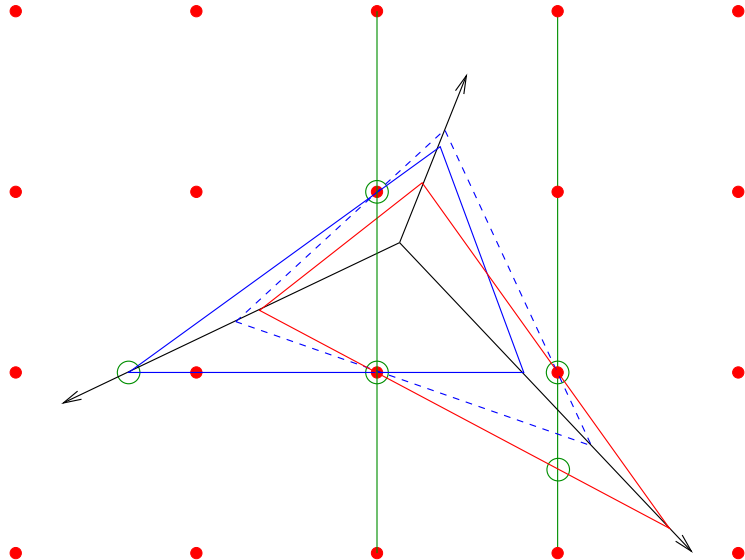
Dissection \equiv each side is tight at exactly one integer point



Similarly this inequality has a finite rank !

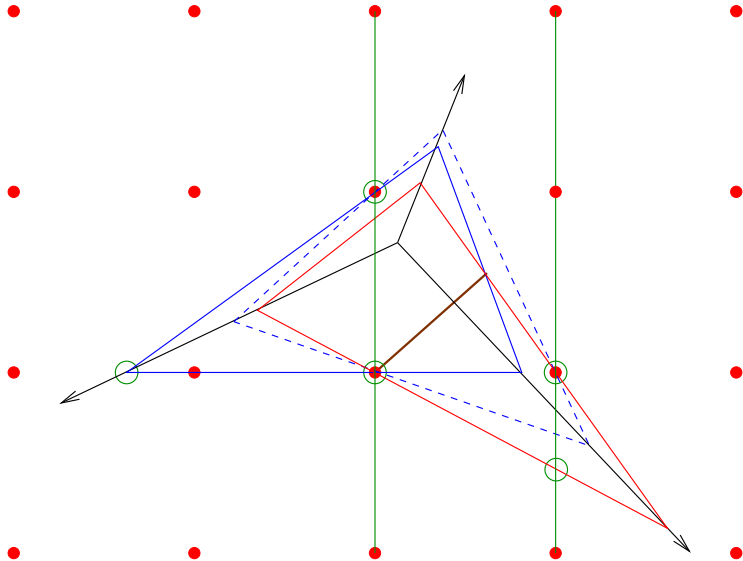
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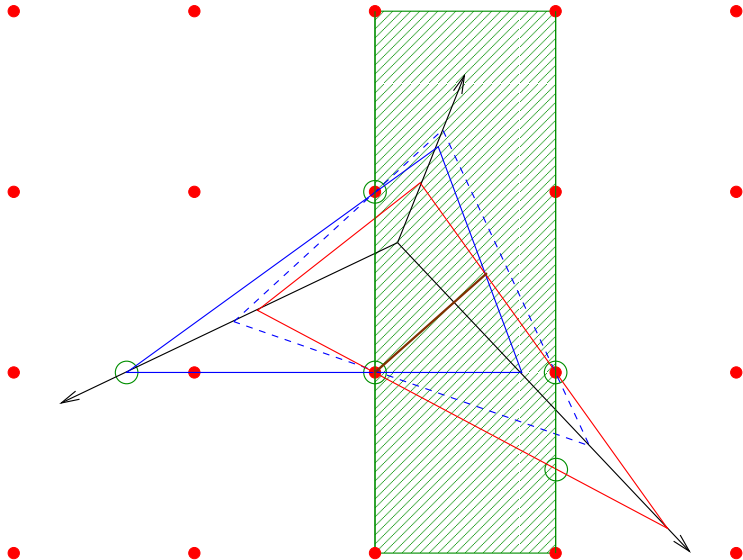
Dissection \equiv each side is tight at **exactly one integer point**



Brown line : set of points with a **representation** that satisfy both inequalities with equality

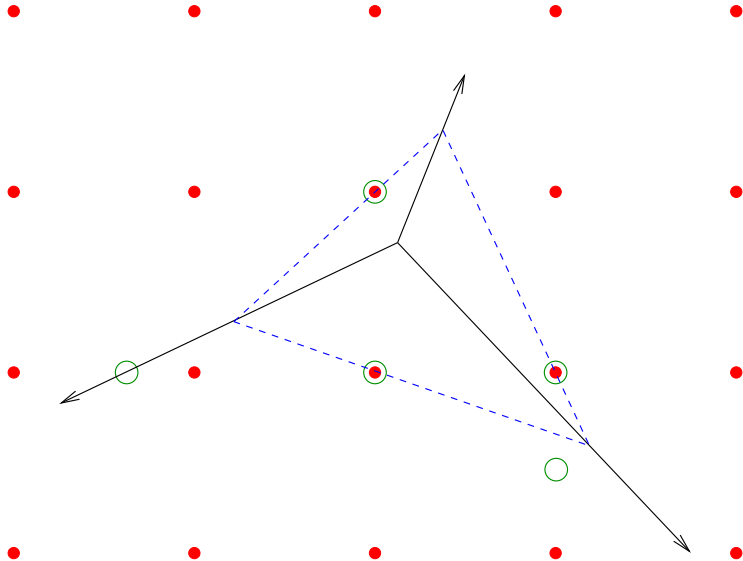
The dissection triangle

Dissection \equiv each side is tight at exactly one integer point



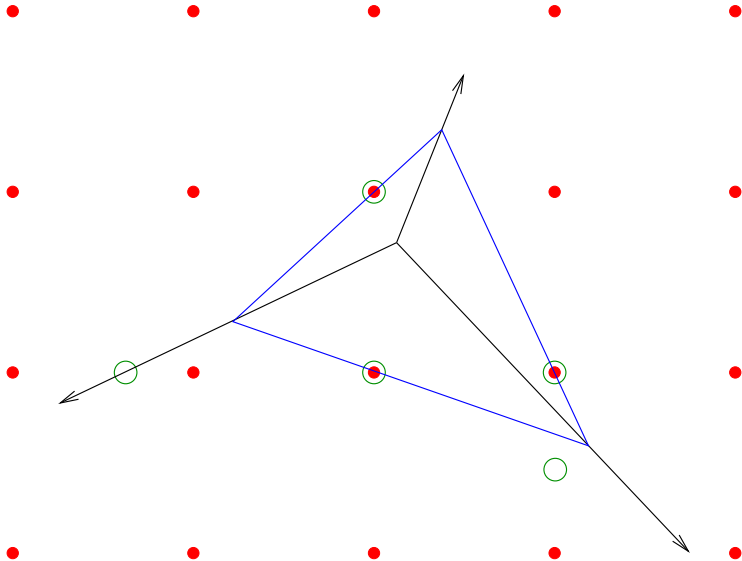
The dissection triangle

Dissection \equiv each side is tight at exactly one integer point



The dissection triangle

Dissection \equiv each side is tight at exactly one integer point



The dissection cut has a finite rank

Conclusion

- All triangles except the **Cook-Kannan-Schrijver** have a finite rank.
- We provide a constructive **split proof** of that fact.
- Split cuts can essentially achieve all triangles in relatively few rounds.
- In contrast with the results of **Basu et al.** on the **triangle closure** compared to the **split closure**.
- All quadrilaterals have a finite rank.
- Open (and difficult) question : **lower bounds** on the split rank.

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